



Genomic Epidemiology of Complex, Multispecies, Plasmid-Borne bla_{KPC} Carbapenemase in *Enterobacterales* in the United Kingdom from 2009 to 2014

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ABSTRACT Carbapenem resistance in Enterobacterales is a public health threat. Klebsiella pneumoniae carbapenemase (encoded by alleles of the blakec family) is one of the most common transmissible carbapenem resistance mechanisms worldwide. The dissemination of bla_{KPC} historically has been associated with distinct K. pneumoniae lineages (clonal group 258 [CG258]), a particular plasmid family (pKpQIL), and a composite transposon (Tn4401). In the United Kingdom, bla_{KPC} has represented a large-scale, persistent management challenge for some hospitals, particularly in North West England. The dissemination of bla_{KPC} has evolved to be polyclonal and polyspecies, but the genetic mechanisms underpinning this evolution have not been elucidated in detail; this study used short-read whole-genome sequencing of 604 $bla_{\rm KPC}$ -positive isolates (Illumina) and long-read assembly (PacBio)/polishing (Illumina) of 21 isolates for characterization. We observed the dissemination of bla_{KPC} (predominantly bla_{KPC-2}; 573/604 [95%] isolates) across eight species and more than 100 known sequence types. Although there was some variation at the transposon level (mostly Tn4401a, 584/604 [97%] isolates; predominantly with ATTGA-ATTGA target site duplications, 465/604 [77%] isolates), bla_{KPC} spread appears to have been supported by highly fluid, modular exchange of larger genetic segments among plasmid populations dominated by IncFIB (580/604 isolates), IncFII (545/604 isolates), and IncR (252/ 604 isolates) replicons. The subset of reconstructed plasmid sequences (21 isolates, 77 plasmids) also highlighted modular exchange among non-bla_{KPC} and bla_{KPC} plasmids and the common presence of multiple replicons within bla_{KPC} plasmid structures (>60%). The substantial genomic plasticity observed has important implications for our understanding of the epidemiology of transmissible carbapenem resistance in Enterobacterales for the implementation of adequate surveillance approaches and for control.

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Antimicrobial resistance (AMR) in *Enterobacterales* is a critical public health threat. Carbapenem resistance is of particular concern, and its evolution and spread in multiple species of *Enterobacterales* (i.e., carbapenemase-producing *Enterobacterales* [CPE]) is increasingly reported (1–4). The exchange of AMR genes, including carbapenem resistance genes, happens at multiple genetic levels (5) and is often facilitated by their presence on plasmids (circular DNA structures of variable size [2 kb to \sim >1 Mb]) and/or other smaller mobile genetic elements (MGEs), such as transposons and insertion sequences (IS), that form part of the accessory genome.

Whole-genome sequencing (WGS) has significantly improved our understanding of infectious disease epidemiology and is used in both community-associated and nosocomial transmission analyses (6, 7). Although useful for delineating transmission routes in clonal, strain-based outbreaks, standard phylogenetic approaches and comparative analyses have been more difficult where multiple bacterial strains/species and transmissible resistance genes are involved (5). The reconstruction of the genetic structures of plasmids carrying relevant antimicrobial resistance genes using long-read sequencing has improved our understanding of the genetic complexity of the spread of important resistance genes but has been difficult to undertake on a large scale.

Although approximately 40 Klebsiella pneumoniae carbapenemase (KPC; encoded by bla_{KPC}) variants have been described (per NCBI's AMR reference gene catalogue, available at https://www.ncbi.nlm.nih.gov/pathogens/isolates#/refgene/), two have been most widely reported globally, namely, KPC-2 and KPC-3 (H272Y with respect to KPC-2; single-nucleotide difference in $bla_{\rm KPC}$ [C814T]) (8, 9). In the United Kingdom, the first KPC isolate identified was a KPC-4-containing Enterobacter sp. isolated in Scotland in 2003 (10), with subsequent identification of KPC-3 in isolates in the United Kingdom in 2007. From 2007, increasing numbers of suspected KPC isolates were referred to the Public Health England (PHE) Antimicrobial Resistance and Healthcare-Associated Infections (AMRHAI) Reference Unit, with the majority of confirmed KPC producers (>95%) being KPC-2 and from hospitals in North West England, first recognized in 2008 to 2009 (11). These isolates were predominantly bla_{KPC} -positive Enterobacterales cultured from patients in the Central Manchester University Hospitals NHS Foundation Trust (CMFT; now part of the Manchester University NHS Foundation Trust) (12). bla_{KPC} is thought to have been introduced into the region via a pKpQIL-like plasmid (13, 14), a plasmid backbone previously associated with the global dissemination of bla_{KPC} in K. pneumoniae clonal group 258 and already observed in other K. pneumoniae sequence types (STs) and species in an analysis of 44 UK KPC-Enterobacterales from 2008 to 2010 (14).

We used WGS to undertake a large-scale retrospective study of this multispecies, polyclonal dissemination of $bla_{\rm KPC}$ in major Manchester hospitals in northwest England from 2009, generating complete genome structures, including $bla_{\rm KPC}$ plasmids, for a subset of isolates. We contextualized our analysis of strains in Manchester by sequencing a subset of isolates from the local region (North West England) and other hospitals in the United Kingdom collected through a national $bla_{\rm KPC}$ surveillance program, with the goal of understanding the genetic structures associated with the regional emergence of $bla_{\rm KPC}$ in this setting.

RESULTS

Of 742 isolates identified for sequencing, 60 (8%) were not retrievable or cultivable from the laboratory archives. After deduplicating by taking the first $bla_{\rm KPC}$ -positive Enterobacterales (KPC-E) isolate per patient and excluding sequencing failures, any sequences without $bla_{\rm KPC}$ (assumed lost in culture), and mixtures (identified from

genomic data analysis; see Materials and Methods), 604 evaluable isolate sequences were included. These represented 327 archived isolates (54%) from inpatients in the early stages of the observed introduction of $bla_{\rm KPC}$ in the two Manchester hospitals studied (2009 to 2011), of which 309 and 18 isolates were from CMFT and the University Hospital of South Manchester NHS Foundation Trust (UHSM; now part of Manchester University NHS Foundation Trust), respectively; 78 (13%) later isolates from CMFT/UHSM (2012 to 2014); 119 (20%) isolates from other hospitals (n=15 hospitals) in North West England (2009 to 2014, excluding CMFT and UHSM, up to the first 25 consecutive KPC-E isolates per hospital); 72 (12%) isolates from UK and Irish hospitals (n=72 locations (n=4 from Ireland)) outside the North West (2009 to 2014) (first KPC-E isolate per hospital); and 8 (1%) isolates from English outpatient/primary care settings (7 from the North West region, 1 from a southern UK location). The geographic and numerical distribution of isolates is depicted in Data S1 in the supplemental material.

Consistent with increasing numbers of $bla_{\rm KPC}$ -positive *Enterobacterales* reported nationally to the reference laboratory, cases in CMFT/UHSM also began to rise from 2009. Anecdotally the first cases were reported in 2009, with 63 carbapenem-resistant *Enterobacterales* cultured from 18,630 microbiological specimens processed (0.3%), with a 10-fold increase by 2014 (988/29593 [3%]) (Data S2).

 $bla_{\rm KPC-2}$ dominates in the United Kingdom, but highly variable $bla_{\rm KPC}$ copy numbers and associated resistance marker profiles suggest a diverse, flexible accessory genome underpinning its spread. Although three $bla_{\rm KPC}$ variants were observed in the 604 included isolates, $bla_{\rm KPC-2}$ dominated ($n=573, 95\%; bla_{\rm KPC-3}, n=27, 4\%; <math>bla_{\rm KPC-4}, n=4, 1\%$). Two isolates (0.3%; trace524 and trace534) showed evidence of mixed populations of $bla_{\rm KPC-2}$ and $bla_{\rm KPC-3}$.

The median $bla_{\rm KPC}$ copy number estimate was 1.8 (interquartile range [IQR], 1.6 to 2.1), with a maximum of 8.2. bla_{KPC} copy number estimates strongly associated with meropenem MICs for the 588 isolates for which both were available (estimated +0.56 higher doubling dilution [95% confidence interval, +0.40, +0.72] per copy number, P <0.0001; Data S3) and also between approaches deriving estimates from short-read assemblies versus those from mapping to reconstructed genomes (Pearson's correlation coefficient, 0.97 [P = 0.0001]; Data S4) (see Materials and Methods). Across the three main species, bla_{KPC} copy numbers were higher in K. pneumoniae (n = 525 [87%], median of 1.8 [IQR, 1.6 to 2.1]) than in Escherichia coli (40 [7%], 1.7 [1.5 to 1.9]) or Enterobacter cloacae (26 [4%], 1.6 [1.4 to 2.0]) (P = 0.0003 by Kruskal-Wallis test) (Fig. 1A). Among common STs, copy numbers were highest in K. pneumoniae ST258 (n = 65 [11%], median of 2.4 [IQR, 1.8 to 2.9]) versus other species/STs (n = 531 [89%],median of 1.8 [1.6, 2.0]) (P = 0.0001 by Kruskal-Wallis test) (Fig. 1B and Data S5). Of note, bla_{KPC} copy number estimates represent an average across all individual cells sequenced; bla_{KPC} copy number estimates of <1 in a small number of isolates (20/604 [3%]) (median of 0.82 [IQR, 0.40 to 0.96]) suggest that a proportion of cells in the populations sequenced have lost their bla_{KPC}-harboring plasmid.

There were 364 distinct resistance marker profiles in isolates, with only 12% (74/604) of isolates sharing exactly the same profile as >10 other isolates (Data Set SD1). Other broad- or extended-spectrum beta-lactamase genes were also commonly present across isolates, including bla_{TEM} (n=452, all $bla_{\text{TEM-1}}$), bla_{OXA} (n=492; $bla_{\text{OXA-9}}$ [n=425] and $bla_{\text{OXA-1}}$ [n=138]), bla_{SHV} (n=497), and $bla_{\text{CTX-M}}$ (n=89; $bla_{\text{CTX-M-15}}$ [n=57] and $bla_{\text{CTX-M-9}}$ [n=28]). Aminoglycoside resistance genes were also widely prevalent: aac (n=243), aph (n=196), and ant (n=373). In terms of acquired quinolone resistance, 160 isolates contained qnr variants, and 137 isolates contained aac(6')-lb-cr; no qep variants were seen.

bla_{KPC} in the United Kingdom is a multispecies, largely polyclonal phenomenon. In contrast to the almost uniform presence of bla_{KPC-2} in isolates, species and lineage diversity among our entire isolate collection was substantial, with eight different species among sequenced isolates. For species with developed multilocus sequence type (MLST) schemes, this represented a total of 102 different known species-ST combinations and 26 additional unknown species-ST combinations, namely, K. pneu-

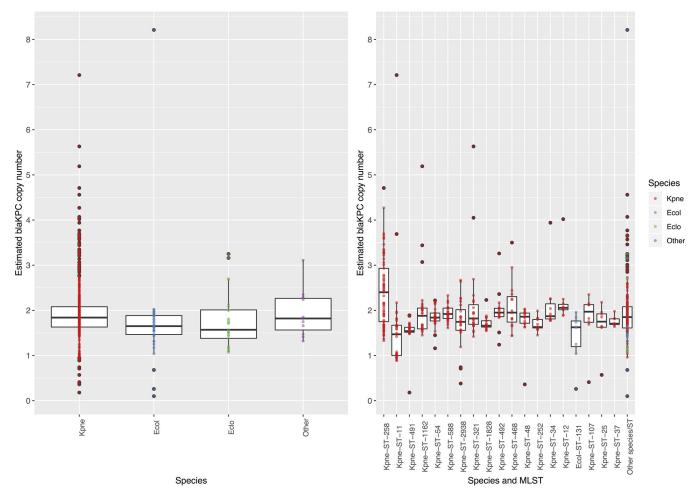


FIG 1 Estimated bla_{KPC} copy number distributions (derived from Illumina assemblies) within major species (left) and the top nineteen most common species/ST combinations (right) observed in the study. Other species were designated "other" (left) and other ST/species combinations as "other species/ST" (right). Dots represent estimated copy numbers for single isolates; boxplots represent median estimated bla_{KPC} copy numbers \pm 1.58 \times IQR/sqrt(n). Boxplots are ordered by most common species and species/ST categories, left to right, except for the other and other species/ST, assigned to the right of the plots. Kpne, Klebsiella pneumoniae; Ecol, Escherichia coli; Eclo, Enterobacter cloacae.

moniae (n = 525 isolates, 70 known STs, 20 unknown STs), E. coli (n = 40, 20 known STs, 1 unknown ST), Enterobacter cloacae (n = 26, 9 known STs, 2 unknown STs), Klebsiella oxytoca (n = 6, 3 known STs, 3 unknown STs), Raoultella ornithinolytica (n = 4), Enterobacter aerogenes (n = 2), Serratia marcescens (n = 1), and Kluyvera ascorbata (n = 1) 1). The most common STs all were for K. pneumoniae, including ST258 (n = 66), ST11 (n = 35), ST491 (n = 31), ST1162 (n = 29), and ST54 (n = 27) (Fig. 2). Among these five common STs, the distribution of pairwise single-nucleotide variant (SNV) distances between isolates suggested that some isolates can be considered highly genetically related at the strain level; however, overall, when considering SNV distances alongside specific accessory genome differences, isolates from these STs were not clonal (Data S6 to S10). Notably, 42% (252/604) of isolates were found in STs represented by \leq 10 isolates (Fig. 2).

Although some of the earliest sequenced isolates in the collection were KPC-K. pneumoniae ST258 and ST11 (both in 2009; two major KPC strains from CG258 circulating globally and in China at the time [8, 15]), and although KPC-producing K. pneumoniae ST258 appears to have been one of the earliest strains observed in the two Manchester hospitals (CMFT and UHSM), multiple diverse STs and species clearly were subsequently rapidly recruited specifically in these two hospital settings in 2010 and 2011, with bla_{KPC} emerging in at least 30 new species-ST groups per year (76% and 59%,

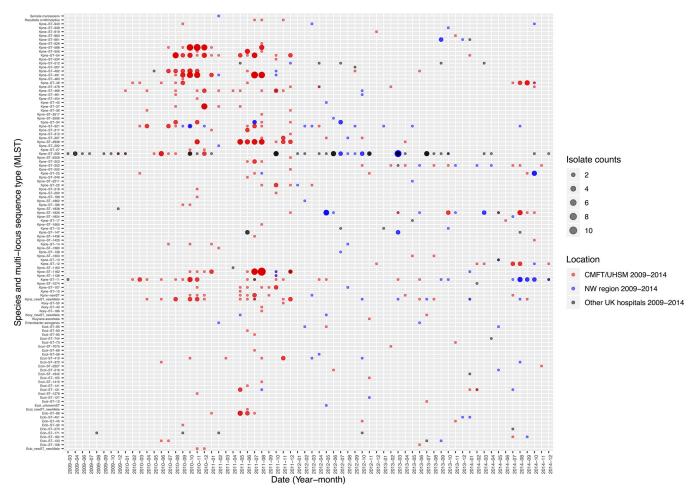


FIG 2 Incidence plot of bla_{KPC} species-ST by year-month and geography. Dots are colored by the location of isolate collection, as defined in Materials and Methods, and scaled by the number of isolates; the eight outpatient isolates were not plotted.

respectively, of first-per-patient carbapenem-resistant Enterobacterales culture positives sequenced) (Fig. 3).

Most bla_{KPC} members in the United Kingdom are supported by a conserved Tn4401a unit with uniform target site sequences, suggesting that direct Tn4401 transposition is not the main mode of $bla_{\rm KPC}$ transmission in this context. In the absence of evidence of significant clonal spread by high-risk bacterial lineages, we explored the diversity among mobile genetic features. Tn4401 is an \sim 10-kb transposon that has been the major transposable context for bla_{KPC} to date, and it is flanked by 5-bp signatures of transposition (target site duplications [TSD] or target site sequences [TSS]) (16, 17), with no known target site specificity (16). A predominant Tn4401 isoform was associated with both $bla_{\rm KPC-2}$ and $bla_{\rm KPC-3}$ in this study, namely, Tn4401a (16), which occurred in 584/604 (97%) isolates (Fig. 4). Other known variants included Tn4401b (n=7) and Tn4401d (n=3). Only 20/584 (3%) isolates demonstrated evidence of SNV-level variation in Tn4401a (homozygous calls at 6 positions; heterozygous calls [i.e., mixed populations] at 3 positions).

 bla_{KPC-2} -Tn4401a (n = 539 isolates) was predominantly flanked by the 5-bp TSD ATTGA, with 465/604 (77%; 465/539 [86%] of this subtype) isolates with this Tn4401/ TSD combination throughout the study period (Fig. 4). In 74 other $bla_{\rm KPC-2}$ -Tn4401aisolates, Tn4401a was flanked by other TSS combinations, consistent with additional transposition events. Thirty-two of these were TSDs (16 AATAT-AATAT, 16 AGTTG-AGTTG), which have been described as being more consistent with interplasmid transposition of Tn4401 (18), and 35 were nonduplicate TSS combinations (ATTGA with

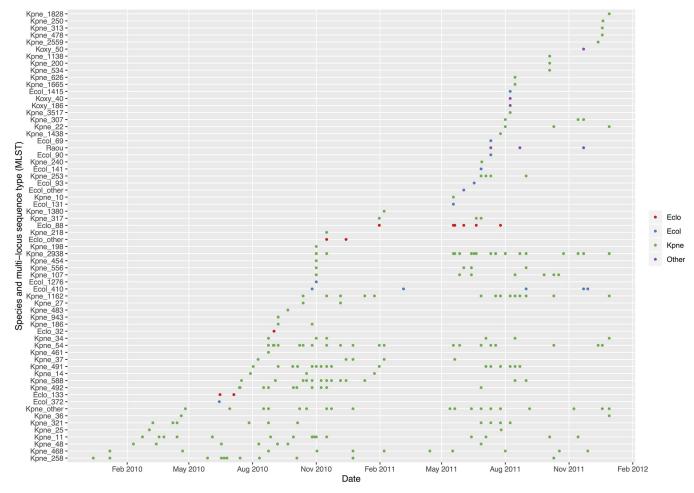


FIG 3 Incidence curve of species-ST in Manchester hospitals CMFT/UHSM, 2010 to 2012. Sequencing ascertainment of first-per-patient carbapenem-resistant Enterobacterales was 76% in 2010 and 59% in 2011.

either ATATA, TGGTA, CTGCC, AATAA, or AGGAT), described as more consistent with intraplasmid transposition. Evidence of multiple TSSs around bla_{KPC-2} -Tn4401a within single isolates was seen in 6 cases (i.e., multiple right and/or left Tn4401 TSSs); 1 case had a right TSS present but no left TSS identified.

Plasmid replicon typing demonstrates diverse plasmid populations present in $bla_{\rm KPC}$ -positive isolates in the United Kingdom but with combinations of IncF, IncR, ColRNAI, and IncX3 replicons predominating. The 604 isolates contained 91 unique combinations of plasmid replicon family types, a crude proxy of plasmid populations present. However, it was not possible to determine the colocalization of specific replicon types on plasmid structures or direct associations with $bla_{\rm KPC}$ using this approach and short-read sequencing data. No isolate was replicon negative. However, there were seven predominant replicon family combinations (Fig. 5) represented in 443/604 (73%) isolates, and these included six major replicon family types, namely, IncF (FIB [found in n=580 isolates] and FII [n=545]), FIA (n=103), IncR (n=252), ColRNAI (n=86), and IncX3 (n=60). IncFIB/IncFII and IncFIB/IncFII/IncR populations were most widely distributed across species-STs (Data S11) and geographical regions as well as over time (Fig. 5). The diversity of plasmid backgrounds present in these isolates may facilitate opportunities for $bla_{\rm KPC}$ exchange among different plasmid families

For many of the plasmid families, several different reference replicon sequences exist in the PlasmidFinder database, with a degree of homology among sequences in the same family, making it difficult to establish robustly which subtype of

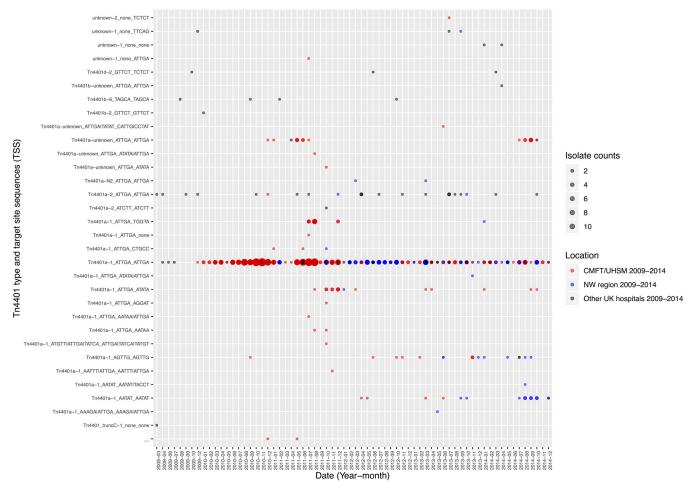


FIG 4 Incidence plot of Tn4401 type and target site sequences by year-month and geography. Dots are colored by location of isolate collection, as defined in Materials and Methods, and scaled by the number of isolates; the eight outpatient isolates were not plotted.

replicon is present. However, restricting to 90% matches to reference replicon types (with matches being a composite of percent sequence identity times percent reference sequence coverage) for these common families, top matches found in more than 10% of isolates included IncFIB(K)_1_Kpn3_JN233704 (n=490 isolates), IncFIB(pQil)_JN233705 (n=299), IncR_1_DQ449578 (n=253), IncFII(K)_1_CP000648 (n=89; plasmid MLST IncFII_{K1}), CoIRNAI_1_DQ298019 (n=86), IncFIA(HI1)_1_HI1_AF250878 (n=80), IncFII_1_pKP91_CP000966 (n=90; plasmid MLST IncFII_{K4}), and IncX3_1_JN247852 (n=61). At this more detailed typing resolution, we found 183 plasmid replicon subtype profiles among our isolates, only ten of which were shared across ≥ 10 isolates and two across more than 10% of isolates. The two most widespread profiles were IncFIB(pQil)_JN233705 + IncFIB(K)_1_Kpn3_JN233704 and IncFIB(K)_1_Kpn3_JN233704 + IncR_1_DQ449578 (Data S12).

Reference, short-read-based $bla_{\rm KPC}$ plasmid typing demonstrates that pKpQIL-like plasmids have been key in disseminating $bla_{\rm KPC}$ in the United Kingdom but that no known $bla_{\rm KPC}$ plasmid vector was responsible in almost a third of cases. We then tried to identify the most likely $bla_{\rm KPC}$ -associated plasmid candidate, as opposed to broadly profiling plasmid populations within isolates by plasmid replicon typing. Attempts to identify complete plasmids from short-read data by comparison to a reference plasmid database have been estimated as being correct in only \sim 45% to 85% of cases in previous studies (5, 19). However, 13/14 (93%) of isolates for which we had hybrid assemblies (see Materials and Methods) with only one completely reconstructed $bla_{\rm KPC}$ plasmid had the correct top match using this $bla_{\rm KPC}$ plasmid typing method (Data Set SD2). We therefore compared all short-read sequences with our

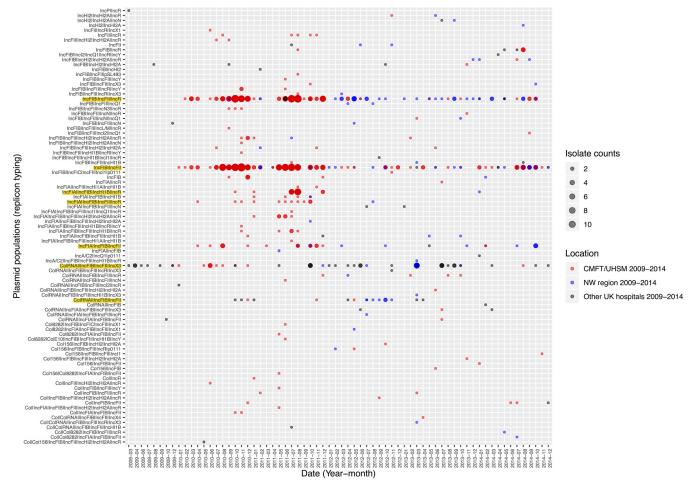


FIG 5 Incidence plot of plasmid populations identified in isolates (replicon typing) by year-month and geography. Dots are colored by location of isolate collection, as defined in Materials and Methods, and scaled by the number of isolates; the eight outpatient isolates were not plotted. The most predominant combinations are highlighted in yellow.

reference $bla_{\rm KPC}$ plasmid database (see Materials and Methods), recognizing that any complete plasmid typing approach from short-read data is suboptimal; matches to one or more reference $bla_{\rm KPC}$ plasmid sequences were identified in 554/604 (92%) isolates. Filtering the single match with the highest score at the predefined threshold of \geq 0.80 left a subset of 428/554 (77%) for evaluation. These 428 isolates had matches to 12 $bla_{\rm KPC}$ plasmid clusters (Fig. 6).

While the majority of isolates appeared to contain pKpQIL-like plasmids (323/604 [53%]), no significant matches to any reference plasmid were found in 162/604 (27%) isolates, suggesting that the genetic background supporting $bla_{\rm KPC}$ in these isolates has diversified substantially and rapidly (Fig. 6). $bla_{\rm KPC}$ plasmid cluster assignations were shared across a median (IQR) of 3 (1 to 6) STs, with pKpQIL-like plasmids being most widespread across species/STs (7 species, 75 STs) (Fig. 6) and clearly playing a major role in the dissemination of $bla_{\rm KPC}$ in Manchester, North West England, and nationally over time (Fig. 7). Other plasmid types identified as top matches across the entire data set included those fully resolved by long-read sequencing performed in this study, some of which were seen in \geq 5% of study isolates (e.g., pKPC-trace75 [a nontypeable replicon]) and in non-North West UK settings, likely reflecting recombination and the generation of new $bla_{\rm KPC}$ plasmid variants in North West England and their subsequent dissemination (Fig. 7). Of note, among the 26 *E. cloacae* isolates sequenced, 12 (46%; five STs) had a match to the pKPC-272-like cluster, suggesting that *E. cloacae* is a particularly suitable host for this plasmid group (Fig. 6).

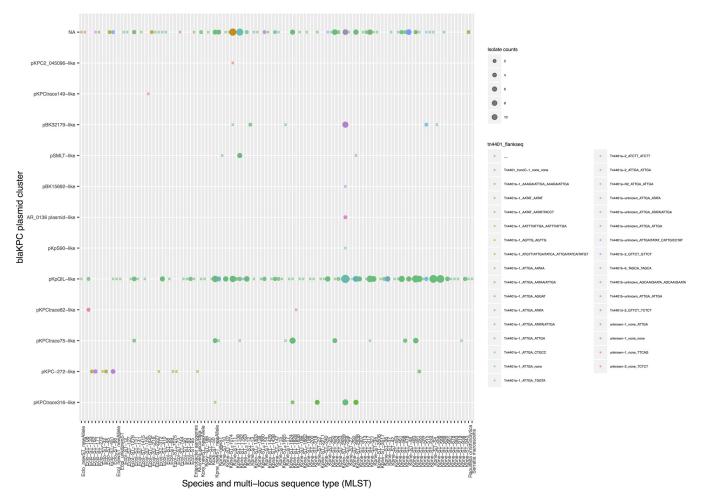


FIG 6 Distribution of bla_{KPC} plasmid types by species-ST. Dots are colored by Tn4401/target site sequence type and scaled by the number of isolates. NA, not assigned.

Reconstruction of a subset of genomes using long-read sequencing data demonstrates a diverse population of plasmids with genetic rearrangement observed in both bla_{KPC}-positive and bla_{KPC}-negative cases. In addition to short-read data, to resolve genetic structures fully we obtained long-read PacBio data for 23 isolates, chosen to maximize the bla_{KPC} plasmid diversity assayed and focusing on isolates collected from the two main Manchester hospitals (12 CMFT isolates and 5 UHSM isolates, plus 2 from other hospitals in North West England and 4 from other UK locations). These included the two earliest available bla_{KPC} isolates from both CMFT and UHSM as well as isolates sharing the same species/ST but with different plasmid replicon combinations or from North West regional versus national locations, samespecies isolates with different STs, and isolates of different species. One PacBio sequencing data set represented a clear isolate mixture (trace597 [UHSM] of E. cloacae ST133 and K. pneumoniae ST258), and for one isolate (trace457 [CMFT]) there were discrepancies between the short-read and long-read sequencing data sets, suggesting a laboratory error (E. cloacae ST45 long read, E. coli ST88 short read). These two assemblies were excluded, leaving 21 assemblies for further analysis (Data Set SD3).

Of the 153 contigs from these 21 assemblies, 30 were clearly chromosomal, 77 plasmid, 1 chromosomal with an integrated plasmid, and 45 with unclear provenance (i.e., possibly phage, plasmid, or chromosomal). Overall, 78/153 (51%) contigs were circularized, including 56/77 (73%) clear plasmid sequences. Thirty-one contigs (21 [68%] circularized) harbored bla_{KPC} , of which 21 were clearly plasmids (14/21 [67%] circularized), and one (trace552, K. pneumoniae ST11) had blakec integrated into the

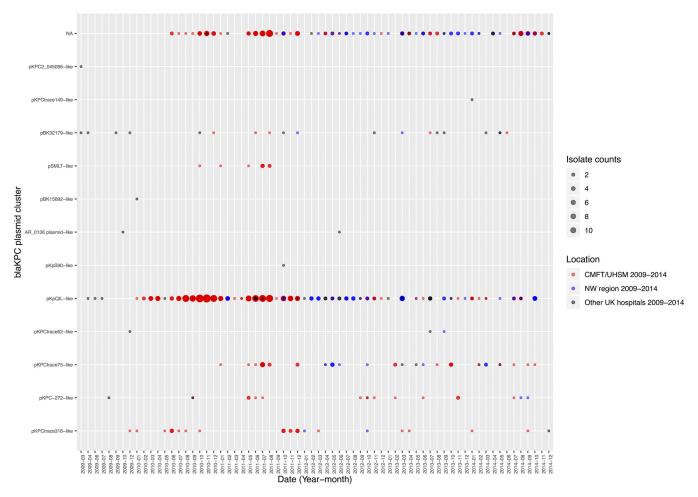


FIG 7 Incidence plot of bla_{KPC} plasmid types identified by year-month and geography. Dots are colored by location of isolate collection, as defined in Materials and Methods, and scaled by the number of isolates; the eight outpatient isolates were not plotted. NA, not assigned.

chromosome (not circularized). For nine other bla_{KPC} -positive contigs, we were not able to clearly ascertain whether these were chromosomal or plasmid (Data Set SD3).

We observed bla_{KPC} in multiple plasmid backgrounds (Fig. 8), including a majority of bla_{KPC} plasmids with multiple replicons (13/21 [60%] clear plasmid contigs, as represented in Fig. 8), particularly with IncFIB/IncFII and/or IncR, consistent with replicon patterns in the isolates overall (Fig. 5). For the IncFII group, for which we had 11 complete, reconstructed plasmid sequences with an IncFII(K)_CP000648-like replicon (plasmidFinder match; 3 bla_{KPC} negative [i.e., not represented in Fig. 8] and 8 bla_{KPC} positive), there was evidence of exchange and rearrangement of plasmid components between both bla_{KPC} -positive and bla_{KPC} -negative plasmids, as well as sharing between STs and species (Fig. 9). For example, between the bla_{KPC}-negative IncFII(K) plasmid isolated from a Raoultella ornithinolytica isolate and a bla_{KPC}-positive K. pneumoniae ST1828 isolate, >70 kb of sequence was \ge 90% identical at the nucleotide level, as well as being largely syntenic [Fig. 9, annotation (i)]. A genetically related IncFII(K)/IncR plasmid was shared across species/lineages (K. pneumoniae [novel ST], E. coli [ST372], and K. pneumoniae [ST883]) and was similar to an IncFII(K)/IncFIB(pQIL) plasmid (found in K. pneumoniae ST1828 and K. pneumoniae ST588) [Fig. 9, annotation (ii)].

In addition to their plasticity, part of the success of these bla_{KPC} plasmids also may be attributable to the presence of toxin-antitoxin plasmid addiction systems (ccdA-ccdB, n=4 bla_{KPC} plasmids; higA, n=6; vapB-vapC, n=11), antirestriction mechanisms (klcA, n = 16; previously shown to promote bla_{KPC} dissemination [20]), and heavy-metal resistance (terB [tellurite], n = 3; ars operon [arsenicals], n = 3; chromate resistance, n = 31; cop operon-pcoC-pcoE [copper], n = 7; mer operon [mercury], n = 10).

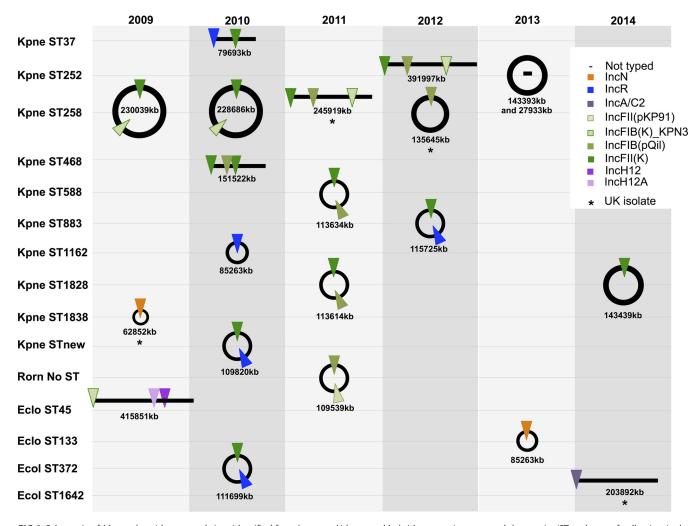


FIG 8 Schematic of *bla*_{KPC} plasmid types and sizes identified from long-read/short-read hybrid sequencing approach by species/ST and year of collection (only 21 contigs clearly designated plasmid are represented). Closed circles denote circularized contigs (i.e., complete plasmids); replicons are denoted by colored triangles in their approximate positions in the structure. Colored triangles denote replicon types assigned to each plasmid sequence (i.e., multiple colored triangles represent multireplicon plasmids). Plasmids from isolates from the wider UK collection (i.e., collected through the national reference laboratory) are denoted with an asterisk.

DISCUSSION

We present the largest WGS-based analysis of $bla_{\rm KPC}$ -positive isolates (n=604) to our knowledge, focused on assessing genetic diversity around the carbapenemase gene itself, rather than limiting the analysis based on species type, and incorporating a sampling frame from UK regional and national collections over 5 years. $bla_{\rm KPC}$ remains one of the three most common carbapenemases observed in the United Kingdom, accounting for \sim 11% of cases referred to the AMRHAI Reference Unit in 2018 (OXA-48-like, 52%; NDM, 27%) (21) and presenting a significant challenge to hospitals in North West England, including Manchester, where it accounted for >97% of carbapenem resistance through 2015 (22).

Our study provides an interesting context in which to consider the findings of a recently published pan-European survey of carbapenem-nonsusceptible K. pneumoniae (the EuSCAPE study; 6 months, 2013 to 2014; 244 hospitals, 32 countries) (23). In EuSCAPE, 684 carbapenemase-producing Klebsiella species isolates were sequenced using Illumina technology, and, similar to our study, most cases were health care exposed (<2% from outpatients). EuSCAPE carbapenemase-producing isolates were also predominantly bla_{KPC} (~45%, n=311 isolates) but mostly bla_{KPC-3} (232/311 [75%] versus 27/604 [5%] in our study) and ST258/ST512 (226/311 [73%] versus 107/525 [20%]

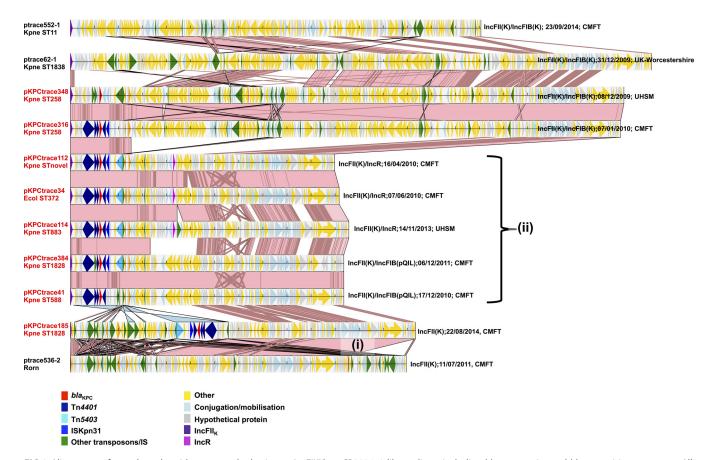


FIG 9 Alignments of complete plasmid sequences harboring an IncFII(K)_1_CP000648-like replicon, including $bla_{\rm KPC}$ -negative and $bla_{\rm KPC}$ -positive sequences. All sequences were reoriented to start at IncFII for the purposes of alignment visualization. Loci of interest have been colored and annotated as shown. Shading between sequences denotes regions of homology, with light pink shading denoting areas of \geq 90% nucleotide identity, dark pink areas of \geq 50% nucleotide identity, and light blue areas of \geq 90% nucleotide identity in reverse orientation. The order of sequences is adjusted to highlight genetic overlap between sequences but not to imply any specific direct exchange events. Annotations (i) and (ii) denote specific features highlighted in the main text.

of *K. pneumoniae* overall in our study). Based on identifying genetic nearest neighbors in their data, the EuSCAPE team found 51% of $bla_{\rm KPC}$ *K. pneumoniae* isolates were most closely related to another isolate from the same hospital. The authors concluded that there was strong geographic structuring of strains, and that the expansion of a few clonal lineages was predominantly responsible for the spread of carbapenemases in *K. pneumoniae* in Europe, with onward nosocomial transmission. Like $bla_{\rm KPC-3}$ in EuSCAPE, $bla_{\rm KPC-2}$ also has been linked with the clonal expansion of ST258 in Australia (24), where 48% of 176 *K. pneumoniae* isolates sequenced were $bla_{\rm KPC-2}$ -containing ST258.

However, instead of clonal expansion, as found in EuSCAPE, in our study we found rapid dissemination of mobile backgrounds supporting $bla_{\rm KPC-2}$, similar to observations from sequencing of other polyclonal $bla_{\rm KPC}$ scenarios reported elsewhere, including the United States (5, 25). Tn4401a, associated with high levels of $bla_{\rm KPC}$ expression (26), previously was seen predominantly in K. pneumoniae and in isolates from the United States, Israel, and Italy, and, similarly, most commonly with an ATTGA-ATTGA TSD (9). Thus, our findings are consistent with the importation of the predominant $bla_{\rm KPC-2}$ -Tn4401a-ATTGA-ATTGA motif into CMFT/North West England and subsequent horizontal spread. Notably, as in EuSCAPE, 46/72 (64%) singleton isolates we sampled from UK hospitals were also CG258, but our much more detailed sampling across species reflected a very different local/regional molecular epidemiology. Although the EuSCAPE study is large and impressive, its breadth may have been limiting in understanding regional diversity; for example, the $bla_{\rm KPC}$ K. pneumoniae subset from the United Kingdom that was analyzed in EuSCAPE consisted of 11 isolates submitted from six

centers (https://microreact.org/project/EuSCAPE_UK). The focus also was more on analyzing species-specific clonal relationships, with no analysis of other species or MGEs.

Although in our study diversification occurred at all genetic levels (Tn4401 plus TSS, plasmids, plasmid populations, strains, and species), there was more limited variation observed within the Tn4401 transposon and its flanking regions, and the spread of bla_{KPC} appears to have been supported by highly plastic modular exchange of larger genetic segments within a distinct plasmid population, particularly IncFIB/IncFII (found in 580 and 545 of the 604 isolates, respectively) and IncR replicons (252/604 isolates). A previous study, in which 11 transformed bla_{KPC} plasmids from the United Kingdom (2008 to 2010) were sequenced (Roche 454/assembly, PCR plus sequencing-based gap closure), identified a UK variant of the pKpQIL plasmid, designated pKpQIL-UK (IncFII_{K2} by plasmid MLST), that was highly similar to pKpQIL (maximum SNV diversity of 32) and several other IncFII_{K2} pKpQIL-like plasmids but with novel segmental genetic rearrangements (gains/losses; pKpQIL-D1 and pKpQIL-D2) (14). Our data also support the importance of $IncFII_{K2}$ -like plasmids in bla_{KPC} dissemination and that other $IncFII_{K}$ -like plasmids in bla_{KPC} mids (e.g., $IncFII_{K1'}$ -K4' -K7' -K15) and replicons (IncFIB and IncR) have been a significant feature. In addition to their plasticity, the plasmids identified frequently harbored AMR genes other than bla_{KPC}, which might offer a selective advantage, alongside heavymetal resistance genes and plasmid toxin-antitoxin addiction systems. The plasticity and association of ${\rm IncFII}_{\kappa}$ plasmids with resistance genes and ${\rm IncFIB}$ replicons has been supported by findings of a recent analysis of IncFII_K plasmids (27).

The problem of accurately classifying plasmid populations from short-read data was exemplified in this analysis and highlighted by our smaller long-read/short-read hybrid assembly-based analysis, which demonstrated significant diversity within structures assigned as similar by short-read-based typing approaches. With this caveat, it was interesting that even with relatively relaxed thresholds, 29% of isolates did not have a match to our reference $\mathit{bla}_{\mathsf{KPC}}$ plasmid database (based on clustering of all publicly available reference sequences, as in Materials and Methods), consistent with rapid diversification in the plasmid backgrounds supporting $Tn4401/bla_{KPC-2}$ in this setting.

Our findings demonstrated that it is also important to consider plasmids without the resistance gene of interest in a population, as these may be relevant to a wider understanding of the transmission and evolution of smaller mobile genetic elements harboring resistance genes (Fig. 9). This was also shown to be relevant in a previous analysis of a large KPC-E. coli outbreak in the same setting in 2015 to 2016, in which a circulating bla_{KPC}-negative plasmid, pCAD3 (IncFIB/FII), acquired Tn4401 from an IncHI2/HI2A bla_{KPC}-positive plasmid and went on to dominate within a clonal E. coli lineage (22). Most studies in general, however, tend to focus on analyzing AMR plasmids of interest. Fortunately, long-read sequencing is becoming increasingly low cost and high throughput, and hybrid assembly is able to reconstruct plasmid sequences in Enterobacterales (28, 29). New developments in large-scale comparative genomics of complete genomes, including plasmid structures, are essential for future large-scale analysis of AMR gene transmission.

There are several limitations to our study. We were only able to long-read sequence a small number of isolates, and the reconstructed genomes generated using long-read PacBio data remained incomplete (49% of all contigs uncircularized). Improvements in long-read technology and assembly approaches will likely overcome this (28). Our short-read and long-read data sets were generated from the same frozen stocks of isolates but from separate subcultures (because we used the short-read data to inform selection for long-read sequencing); ideally they would have been generated from the same DNA extract. PacBio sequencing library preparation incorporates size selection, and this may have led to short plasmid sequences (<15 kb) being lost. Our interpretation of the evolution of backgrounds supporting bla_{KPC} was limited by the diversity present and the inability to capture sequential evolutionary events, even with this large study. We restricted our WGS reference-based plasmid typing to analyzing top matches to our bla_{KPC} plasmid database because of the uncertainty in using short-read data for plasmid typing (19); therefore, we may have underestimated the diversity of bla_{KPC}

plasmids present and missed cases with >1 $bla_{\rm KPC}$ plasmid. Lastly, very limited epidemiological data linked to the isolates were available, meaning that we were unable to ascertain any epidemiological drivers that might be contributing to the enormous heterogeneity of $bla_{\rm KPC}$ transmission over apparently short time frames; the latter finding also precluded the useful application of standard phylogenetic approaches based on identifying variants core to and within species. In addition, the collection of isolates by PHE as part of regional and national surveillance was dictated by referral patterns of isolates from the hospitals surveyed, and we do not have any denominator information on cultures (either $bla_{\rm KPC}$ positive or $bla_{\rm KPC}$ negative) to corroborate details on the robustness of this referral process or to determine what proportion of all UK $bla_{\rm KPC}$ -positive *Enterobacterales* over the relevant time frame we have sequenced.

In conclusion, our large analysis highlights the difficulty and complexity of bacterial transmission networks once important AMR genes have "escaped" the genetic confines of particular mobile genetic elements and bacterial species/lineages, with important implications for surveillance. These include the need to consider multiple bacterial species and plasmids as potential hosts of $bla_{\rm KPC}$ and invest resources in sequencing approaches to adequately reconstruct genetic structures and avoid misinterpreting the molecular epidemiology. It also demonstrates that regional differences in AMR gene epidemiology may be quite marked, which may affect the generalizability of control methods. Finally, it is important to consider the wider genetic background of host strains and plasmids in understanding the evolution and dissemination of important AMR genes, as AMR gene transfer between plasmid backgrounds within bacteria may occur over short timescales, and the interaction of several plasmids (i.e., not just those harboring the AMR gene of interest at any given time) in a population may be highly relevant to the persistence and dissemination of the AMR gene itself.

MATERIALS AND METHODS

Study isolates and setting. We sequenced archived carbapenem-resistant *Enterobacterales* isolates from two large teaching hospitals in Manchester (formerly known as CMFT and UHSM), aiming to include all inpatient isolates archived following the observed introduction of *bla*_{KPC}-positive *Enterobacterales* (KPC-E) in this hospital system in 2009 to 2011. We also sequenced a subset of (KPC-E) isolates archived and sequenced as part of regional and national surveillance of carbapenemases undertaken by Public Health England (PHE; 2009 to 2014). The PHE set included (i) a further random set of isolates referred from CMFT/UHSM from 2012 to 2014; (ii) up to the first 25 consecutive KPC-E isolates from any hospital in North West England (2009 to 2014) and referred to the PHE reference laboratory (2009 to 2014); (iii) the first KPC-E isolate from any other hospital in the United Kingdom and Ireland referred to PHE (2009 to 2014); and (iv) any KPC-E isolates from outpatient/primary care settings in the United Kingdom referred to PHE (2009 to 2014). For the UHSM/CMFT isolate subset, we were able to determine sampling and clinical sample culture-positivity denominators from an anonymized database of linked electronic bacteriology and patient administration records going back to 2009 (22).

Ethical approval was not required as only bacterial isolates were sequenced, and their collection was part of infection control investigation and management.

DNA extraction and sequencing. For short-read Illumina sequencing (150-bp PE reads; HiSeq 2500), DNA was extracted using QuickGene (Fujifilm, Japan), with an additional mechanical lysis step following chemical lysis (FastPrep; MP Biomedicals, USA). Sequencing libraries were constructed using the NEBNext Ultra DNA sample prep master mix kit (NEB), with minor modifications, and a custom automated protocol on a Biomek FX (Beckman). The ligation of adapters was performed using Illumina multiplex adapters, and ligated libraries were size selected using AMPure magnetic beads (Agencourt). Each library was PCR enriched with custom primers (index primer plus dual-index PCR primer) (30). Enrichment and adapter extension of each preparation was obtained using 9 μ l from a size-selected library in a 50- μ l PCR. Reaction mixtures then were purified with AMPure beads (Agencourt/Beckman) on a Biomek NXp after 10 cycles of amplification (per Illumina recommendations). Final size distributions of libraries were determined using a Tapestation 1DK system (Agilent/Lab901) and quantified by Qubit fluorometry (Thermofisher).

For long-read sequencing (PacBio [n=28]), DNA was extracted using the Qiagen genomic tip 100/G kit (Qiagen, Netherlands). DNA extracts were initially sheared to an average length of 15 kb using g-tubes, as specified by the manufacturer (Covaris). Sheared DNA was used in SMRTbell library preparation, as recommended by the manufacturer. The quantity and quality of the SMRTbell libraries were evaluated using the high-sensitivity dsDNA kit and Qubit fluorimeter (Thermo Fisher Scientific) and DNA 12000 kit on the 2100 Bioanalyzer (Agilent). To obtain the longest possible SMRTbell libraries for sequencing (as recommended by the manufacturer), a further size selection step was performed using the PippinHT pulsed-field gel electrophoresis system (Sage Science), enriching for SMRTbell libraries of >15 kb for loading onto the instrument. Sequencing primer and P6 polymerase were annealed and bound to the

SMRTbell libraries, and each library was sequenced using a single SMRT cell on the PacBio RSII sequencing system.

Sequence data processing and assembly. We used Kraken (31) to assign species to sequenced isolates from short-read (Illumina) data. SPAdes v3.6 (32) was used to de novo assemble short reads (default options; subsequent removal of contigs shorter than 500 bp and assembly coverage of $<2\times$). Isolates with short-read sequence assemblies of >6.5 Mb were excluded to ensure that potentially mixed sequences were not included in the analyses. MLST was derived in silico from short-read assemblies by de novo blasting these against publicly available MLST databases for E. coli (http://mlst.warwick.ac.uk/ mlst/dbs/Ecoli), K. pneumoniae, E. cloacae, and K. oxytoca (https://pubmlst.org/). Isolates with mixed MLST outputs were excluded. Antimicrobial resistance (AMR) genes, plasmid replicon (Inc) types, and insertion sequences (IS) were identified from short-read data using resistType (https://github.com/hangphan/ resistType_docker; curated AMR gene database as in reference 33, plasmid replicon reference sequences from PlasmidFinder [34], and ISs from the ISFinder platform [35]; ≥80% identity was used as a threshold). bla_{KPC} copy number (per bacterial genome) for each isolate was estimated from short-read assemblies by dividing coverage of the contig containing $\mathit{bla}_{\mathsf{KPC}}$ by the average coverage for the assembly (weighted by contig length). Confirmation that this was a biologically meaningful estimate was obtained by estimating the association between copy number estimates and meropenem MICs from routine clinical laboratory antimicrobial susceptibility testing using interval regression [outcome log₂(MIC), left and right censored to reflect the actual MIC in the extreme categories being unobserved but only within a range] as the dependent variable and KPC copy number as the independent variable. bla_KPC copy number estimates also were validated by mapping Illumina reads to the reconstructed genomes derived from the PacBio data (using bwa-mem [bwa-0.7.12-r1034] [36] only where both chromosome and bla_{KPC} plasmid structures were deemed complete) and then by calculating mean coverage for the $bla_{\rm KPC}$ gene versus the chromosomal contig and comparing this with the $bla_{\rm KPC}$ copy number estimate derived from the short-read assembly described above. Plasmid MLST for common family types identified in short-read data was confirmed by 100% sequence matches to reference alleles for families catalogued on the plasmidMLST website (https://pubmlst.org/plasmid/) (IncA/C, IncHI1/2, and IncN).

For the smaller subset of isolates on which long-read (i.e., PacBio) sequencing was performed, long-read data were assembled using the HGAP pipeline (37) and polished with the corresponding Illumina data sets using Pilon (version 1.18; default parameters) (38). Chromosomal sequences and plasmid sequences then were manually curated where possible to create complete, closed, circular structures by using BLASTn to identify overlaps at the end of assembled contigs. Those with overlapping ends larger than 1,000 bp with sequence identity of >99% were considered circularized/complete and trimmed appropriately for resolution. Complete sequences were annotated using PROKKA (version 1.11) (39); annotations were used to determine genes known to encode toxin-antitoxin systems, heavy-metal resistance, and antirestriction mechanisms. Plasmid MLST was confirmed for these assemblies as described above.

Tn4401 typing. Tn4401 typing was performed using TETyper (9), using the Tn4401, single-nucleotide polymorphism, and structural profile reference files included with the package (https://github.com/ aesheppard/TETyper, version 1.1), as well as a flanking length of 5 bp, representative of the known target site signature sequence indicative of Tn4401 transposition (40).

Plasmid database for bla_{KPC} plasmid typing. A reference bla_{KPC} plasmid sequence database composed of bla_{KPC} -harboring contigs/plasmids from long-read sequencing of isolates in this study and all complete blaker plasmids from references 41-43 (August 2018) was used for blaker plasmid typing in this study. To construct this database, all 279/6,018 evaluable plasmid sequences carrying blaker. first were compared using dnadiff (44) to obtain the pairwise similarity between any two plasmid sequences, p_i and p_i . The similarity was defined as a function of their lengths, l_i and l_i , and the aligned bases, l_{ii} and $I_{ii'}$ as reported by the equation

$$(p_i, p_j) = \frac{1}{2} \left(\frac{l_{ij}}{l_i} + \frac{l_{ji}}{l_j} \right) \times \min \left(\frac{l_i}{l_j}, \frac{l_j}{l_i} \right)$$

The score was designed to penalize differences in lengths of the compared sequences, i.e., to make sequences of different lengths proportionately more different. The resulting similarity matrix was used to perform clustering of plasmid sequences using the affinity propagation clustering technique, suitable for graph clustering problems with sparse similarity matrix and uneven cluster size and cluster number (45), and it resulted in 34 clusters of 1 to 43 plasmids per cluster (see Data Set SD4 in the supplemental material). The largest cluster was the set of pKpQIL-like plasmids comprising 43 related sequences. Representative sequences of each $\mathit{bla}_{\mathsf{KPC}}$ plasmid cluster in this network were chosen randomly to generate a set (KPC-pDB) of plasmids ranging from 7,995 bp (GenBank accession no. NC_022345.1; plasmid pAP-2) to 447,095 bp (NZ_CP029436.1; plasmid pKPC_CAV2013) in the final database used for bla_{KPC} plasmid typing in this study.

Subsequently, bla_{KPC} plasmid typing for each study isolate sequence was performed as follows. (i) Assembled sequences for each isolate were subjected to BLAST (BLASTn) searches against KPC-pDB. (ii) Any >1-kb contig with >90% nucleotide identity and >80% total coverage match to sequences in KPC-pDB was retained. (iii) For any sequence p_i in KPC-pDB, a score, s_i was calculated by dividing the total matched bases of all contigs matched to p_i by p_i 's length. (iv) An isolate was assumed to plausibly carry p_i if s_i was \geq 0.80. An isolate could have several bla_{KPC} plasmid matches; we restricted to the top match for each isolate in our analyses.

Phylogenetic reconstruction for isolates from commonly represented STs. To ensure that for the most common STs (K. pneumoniae STs 258, 11, and 491) we were essentially not characterizing a single. highly clonal set of sequences, recombination-corrected phylogenies were reconstructed for each ST

following mapping to the K. pneumoniae reference MGH78578 (GenBank accession no. CP000647.1), as previously described (46). In brief, following read mapping, variant calling, and generation of consensus fasta sequences of variants called, IQtree followed by ClonalFrameML were run using a python wrapper, available at https://github.com/davideyre/runListCompare (accessed January 2020).

Statistical analysis and data visualization. Statistical analysis (Kruskal-Wallis tests, interval regression, and Pearson's correlation) was carried out in Stata 14.2. Plots for Fig. 1 and 7 and supplemental figures were generated using the ggplot2 and ape packages in R (version 1.1.463). Figure 9 was generated using the GenomeDiagram package (47) in Biopython (48).

Sequencing data availability. Sequencing data have been deposited in the NCBI database (Bio-Project accession no. PRJNA564424). PacBio/Pilon assemblies are available at https://doi.org/10.6084/m9 .figshare.11777631.v1. Typing results and metadata for each isolate are available in Data Set SD1.

SUPPLEMENTAL MATERIAL

Supplemental material is available online only.

SUPPLEMENTAL FILE 1, PDF file, 0.6 MB. SUPPLEMENTAL FILE 2, XLSX file, 0.1 MB. SUPPLEMENTAL FILE 3, XLSX file, 0.04 MB. SUPPLEMENTAL FILE 4, XLSX file, 0.1 MB.

SUPPLEMENTAL FILE 5, XLSX file, 0.1 MB.

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